

PETER MELCHIOR (PRINCETON)

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# WFIRST & LSST



# THE CASE FOR GROUND & SPACE

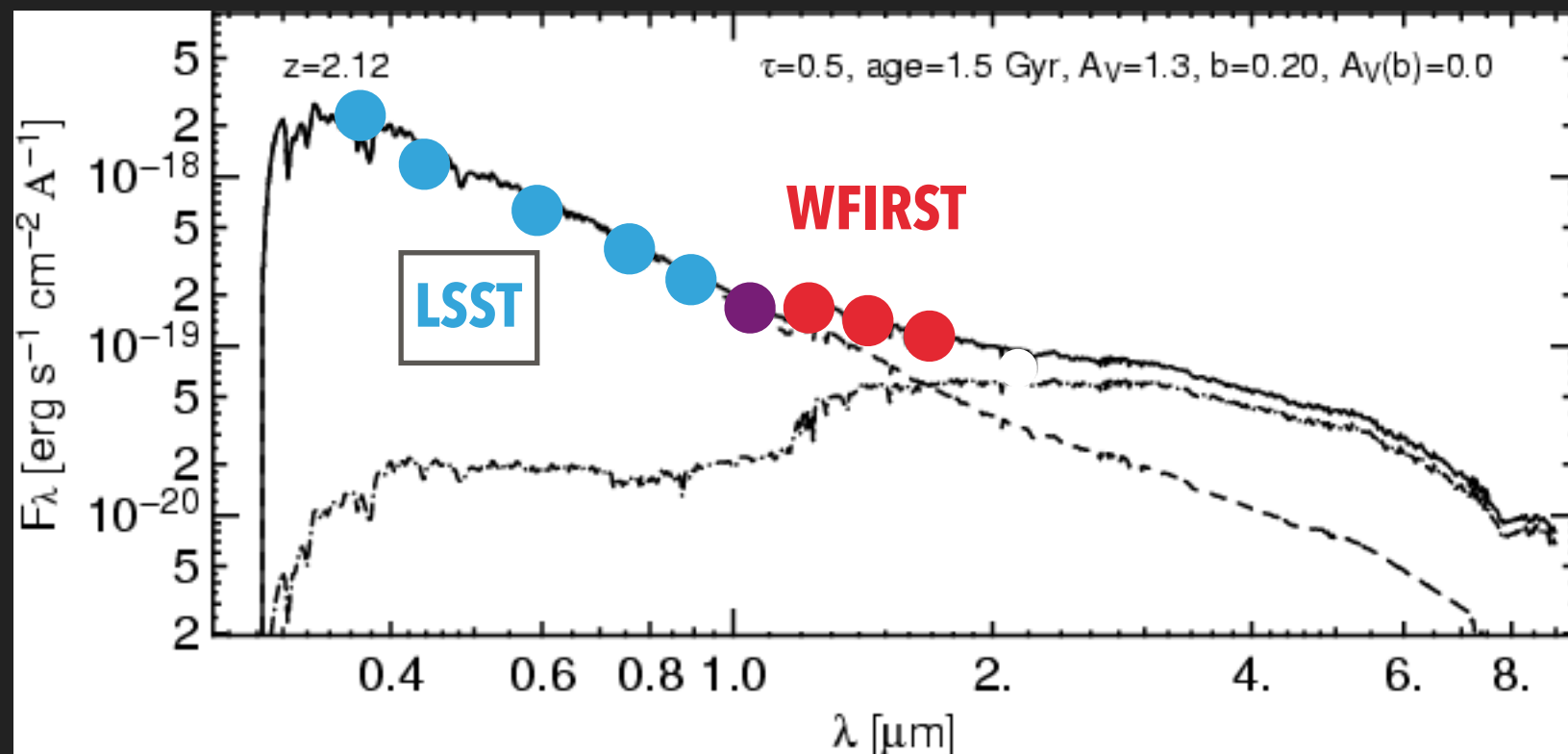


# THE CASE FOR GROUND & SPACE

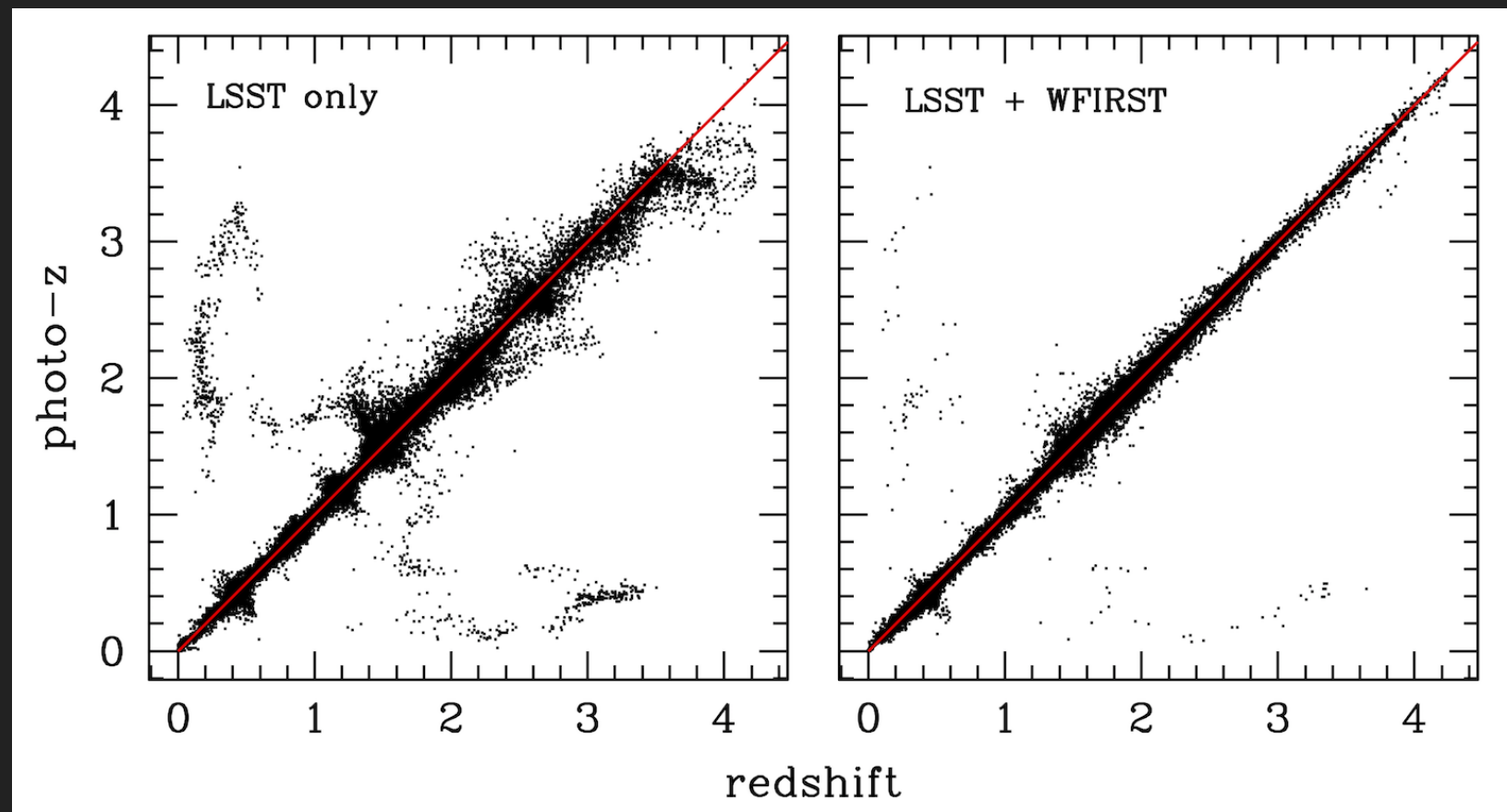
CLASH WFC3/IR data, image by Dan Coe



# SYNERGIES FOR PHOTOMETRY / PHOTO-Z



from Elsner (2008)



from Jain et al. (2015)



# BLENDING





# PHOTOMETRY WITH BLENDS

- ▶ Aperture fluxes do not work!
- ▶ Deblender must disambiguate galaxies vs stars vs moving objects
- ▶ That deblender is as complicated as a model fitter
- ▶ Once detection is done: deblending is as hard as model fitting



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- ▶ That deblender is as complicated as a model fitter
- ▶ Once detection is done: deblending is as hard as model fitting
- ▶ Model fitting can do a lot simultaneously (e.g. DCR)
- ▶ Model fitting can include detection
- ▶ Models for blended objects are unstable!



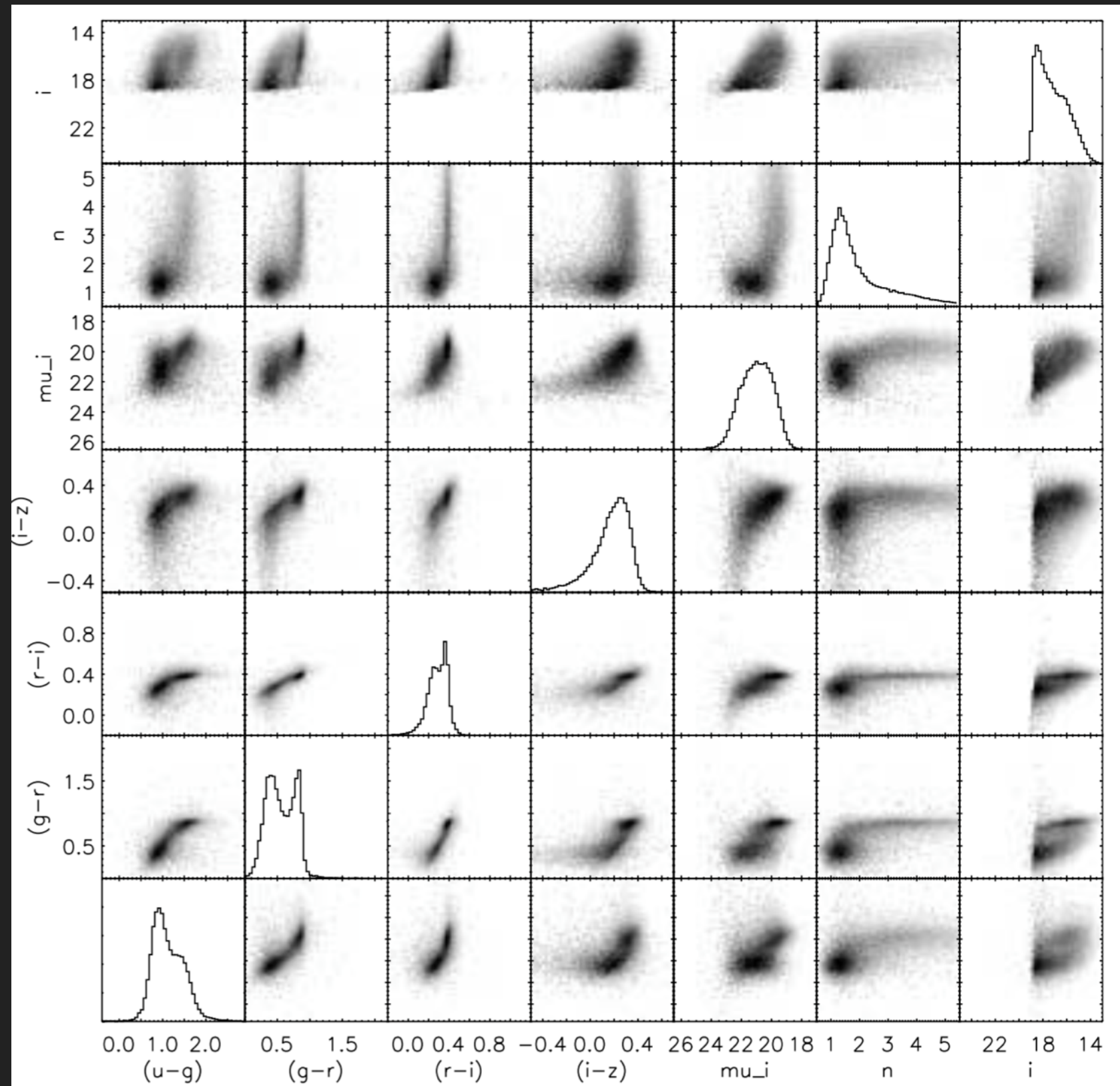
# COLOR – MORPHOLOGY RELATIONS





# MORPHOLOGY FOR PHOTO-Z'S

- ▶ Wray & Gunn (2008)
- ▶ joint galaxy relations exist (at low  $z$ )
- ▶ photo- $z$ 's can be improved by factor  $\sim 1.5$  with
  - ▶ luminosity
  - ▶ Sersic index
  - ▶ surface brightness





# PHOTOMETRY AND SHAPE PARAMETERS

- ▶ General estimator:  $p(\theta \mid D) \propto p(D \mid \theta) p(\theta)$
- ▶ Single band:  $p(A_b, \theta_b \mid D_b) \propto p(D_b \mid A_b, \theta_b) p(\theta_b)$
- ▶ Multiple bands: 1)  $p(A, \theta \mid D) \propto \prod_b p(D_b \mid A_b, \theta_b) p(\theta_b)$



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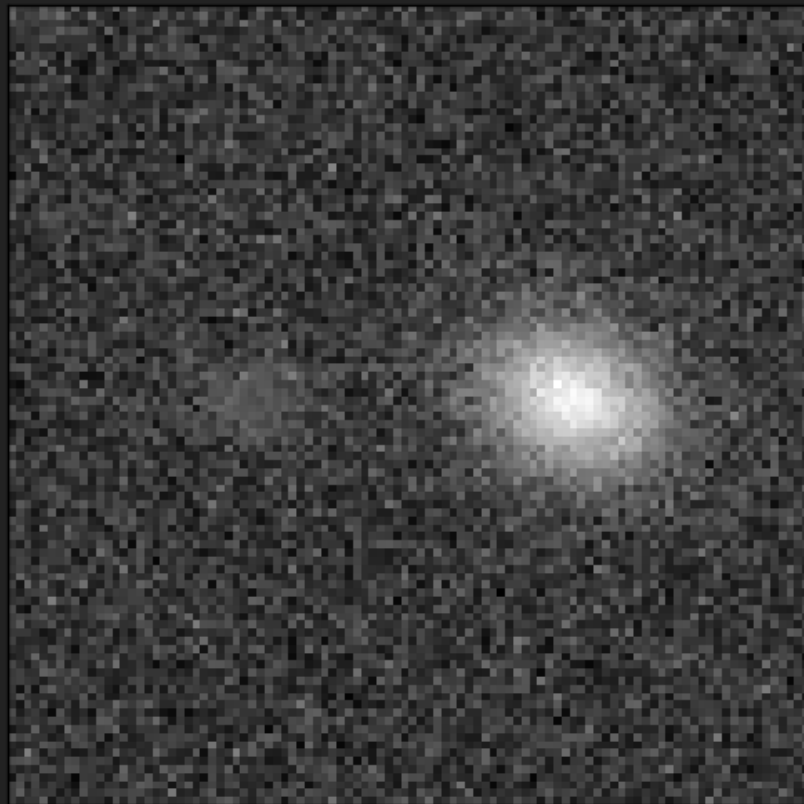
# A SIMPLE TEST CASE FOR SHAPE & PHOTO-Z

- ▶ single Sersic-type galaxies, convolved with constant Gaussian PSF
- ▶ SEDs and morphologies from late-type and early-type galaxy
- ▶ simple template redshifts

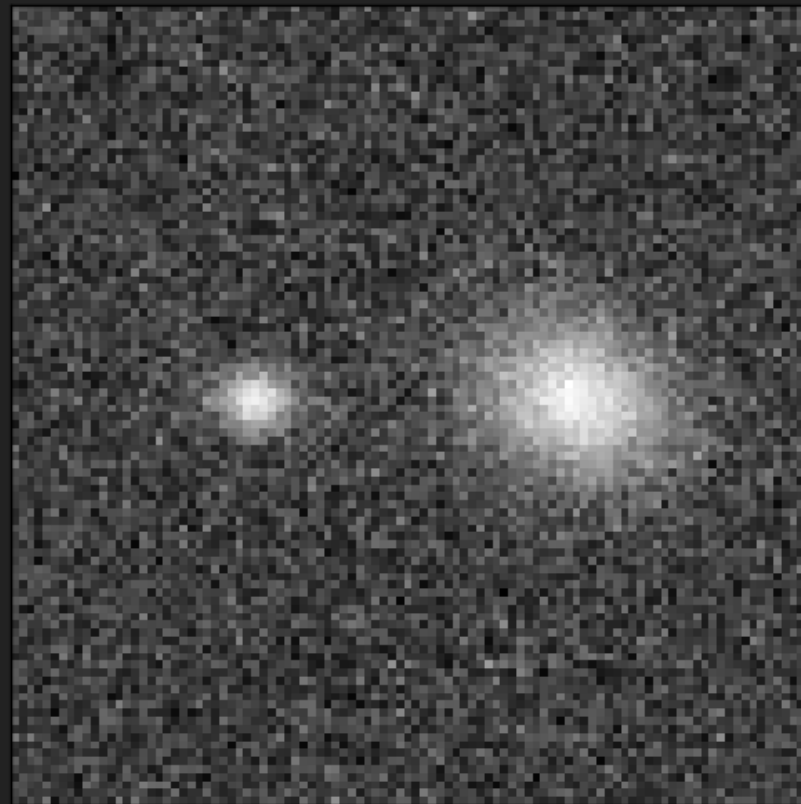




# 1) INDEPENDENT MEASUREMENTS



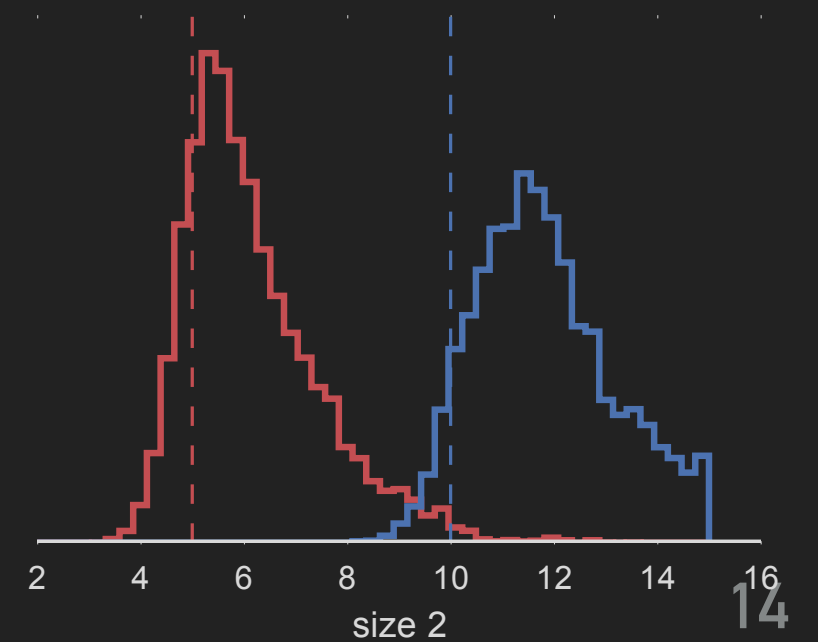
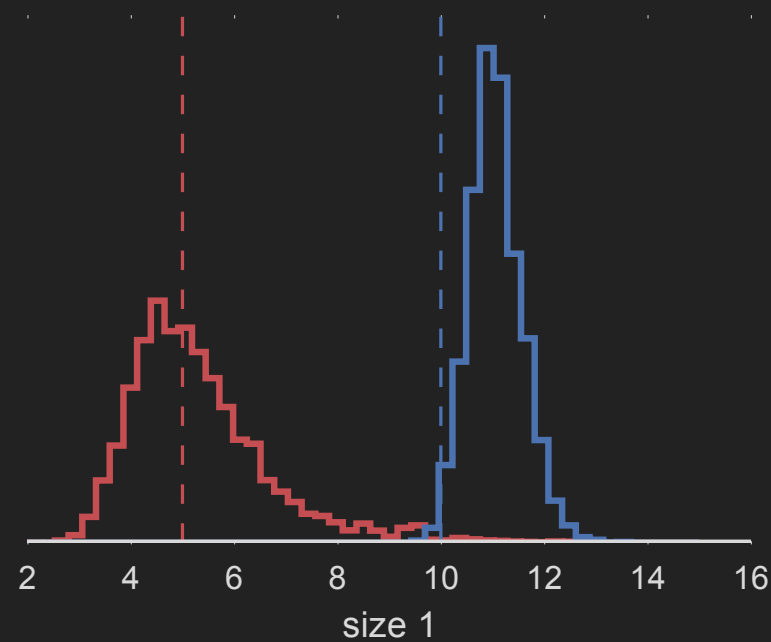
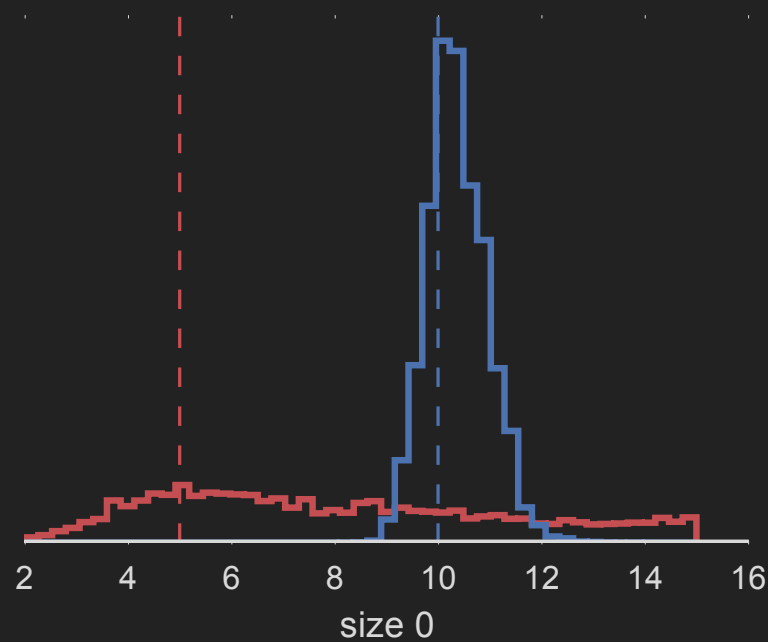
g band



r band

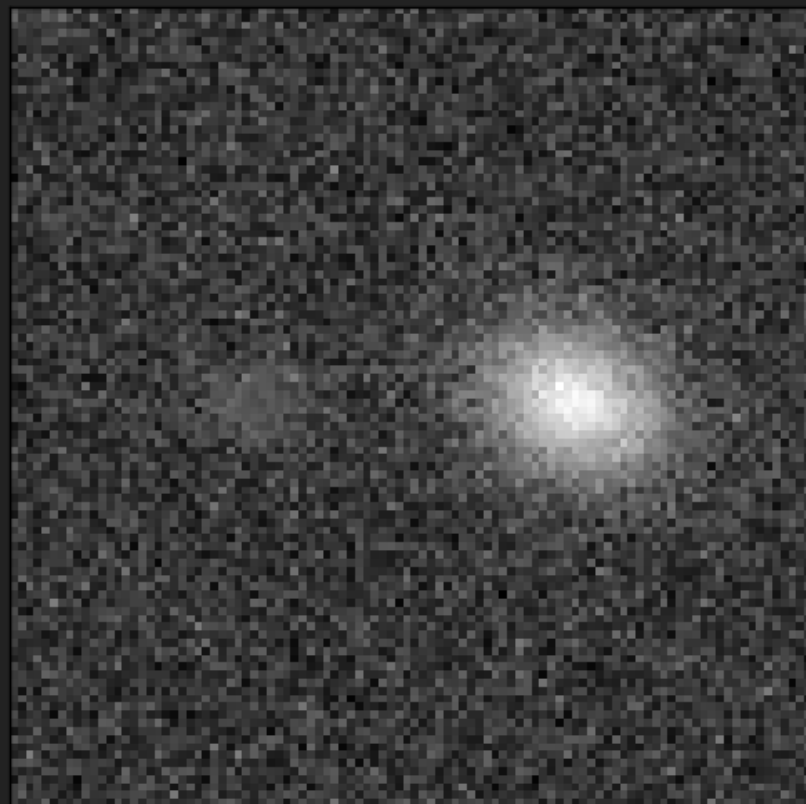


i band

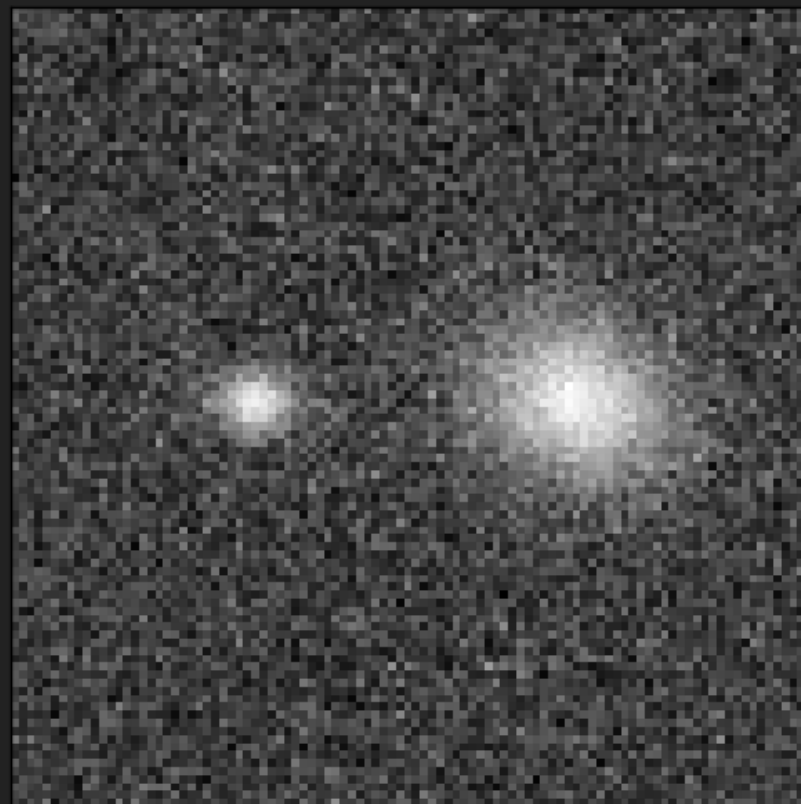




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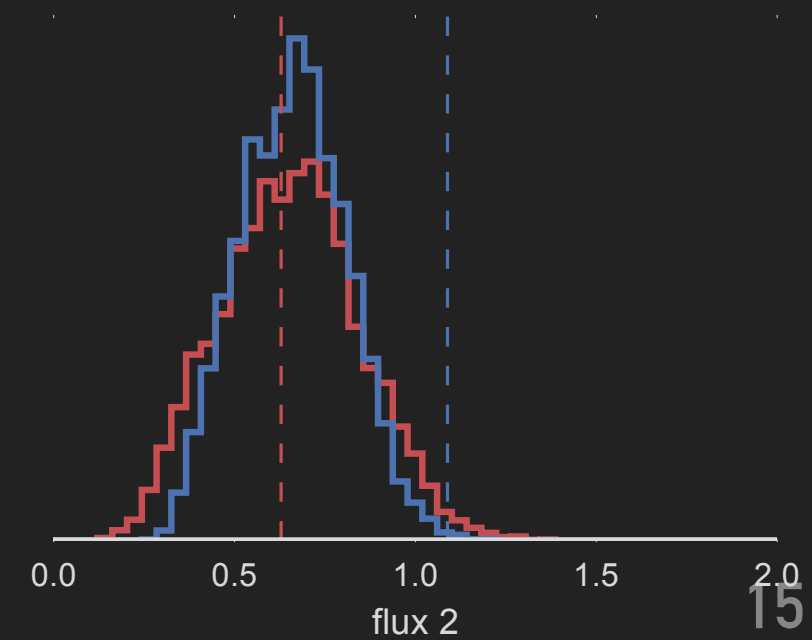
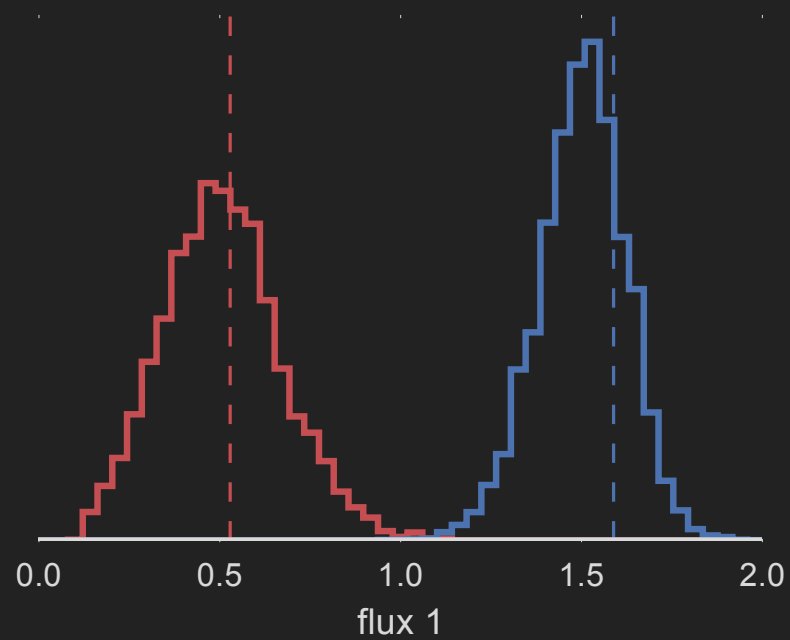
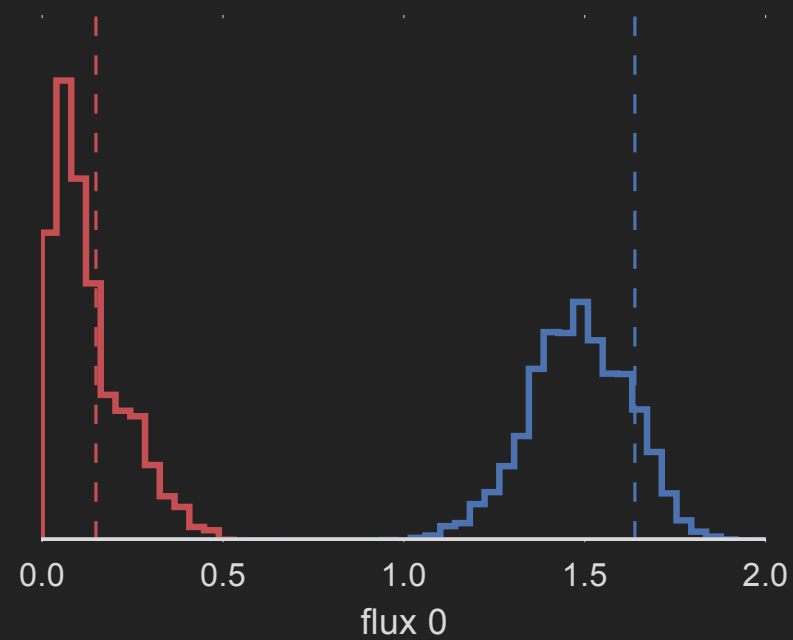
g band



r band

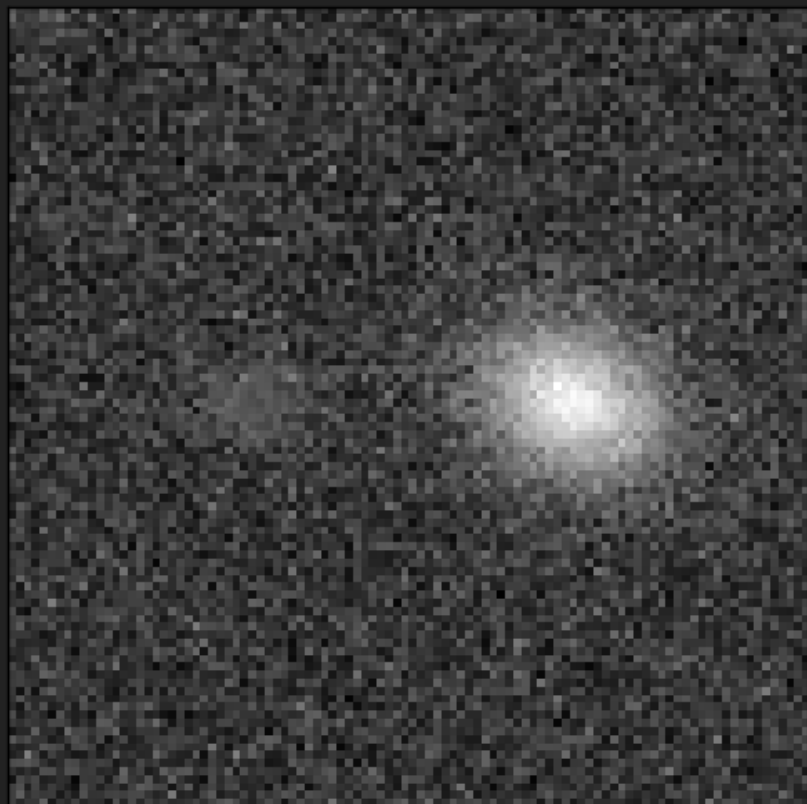


i band

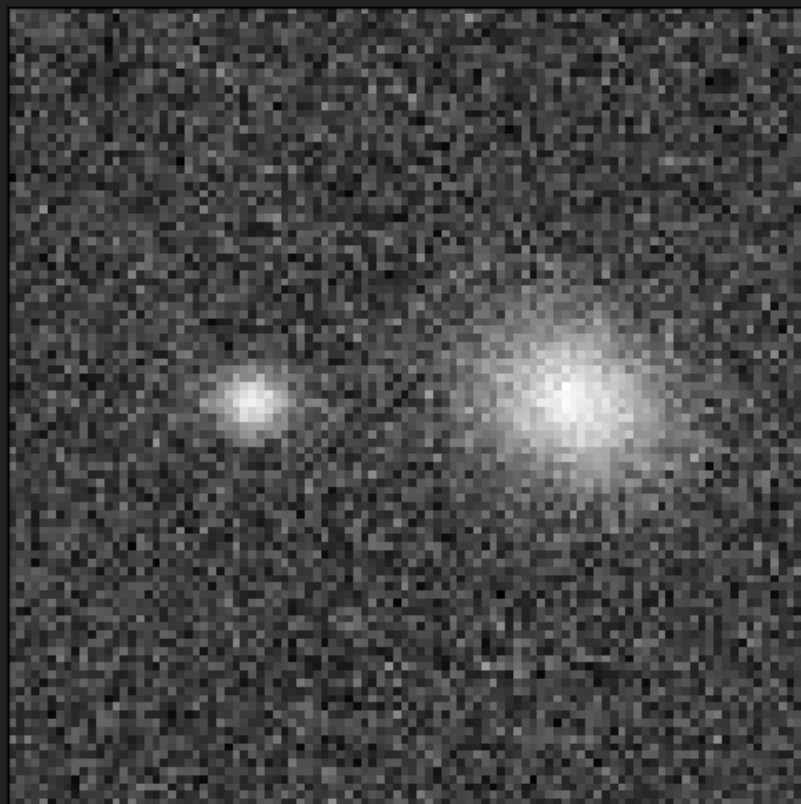




## 2) MATCHED “APERTURES”



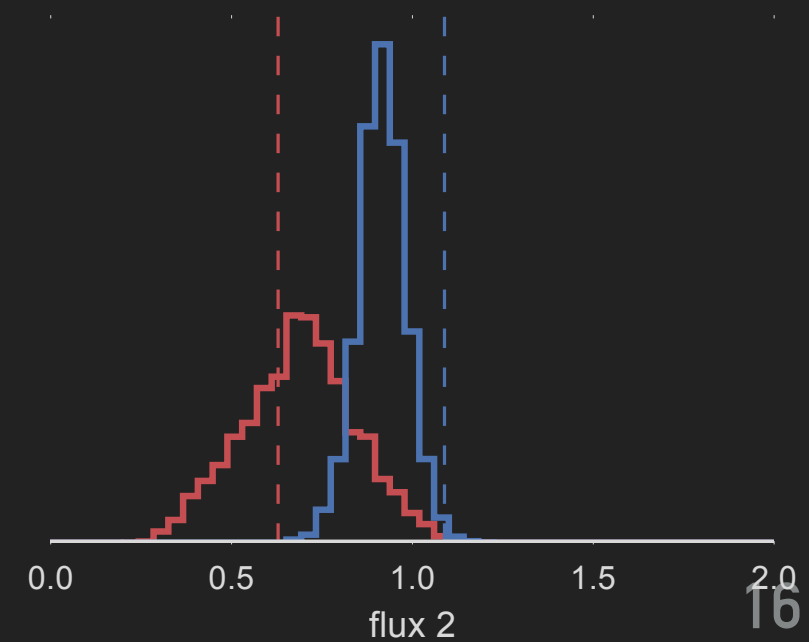
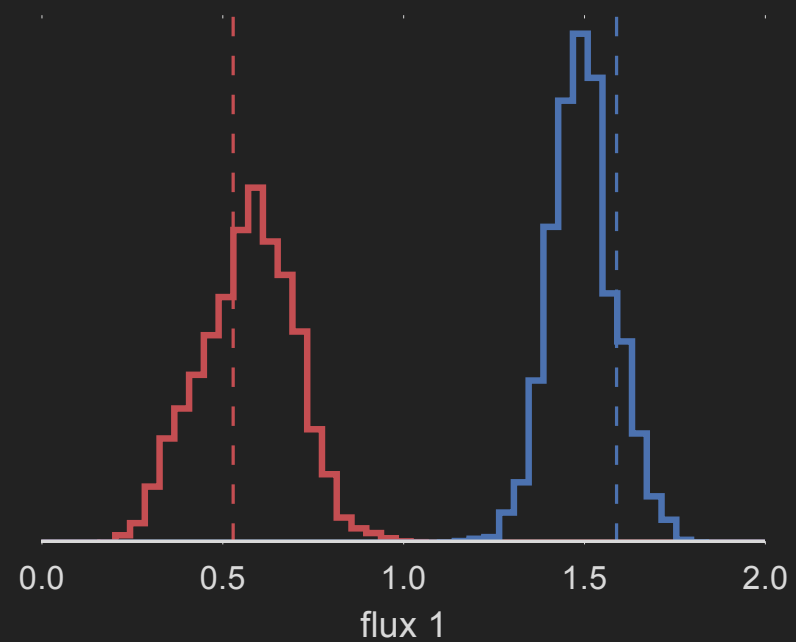
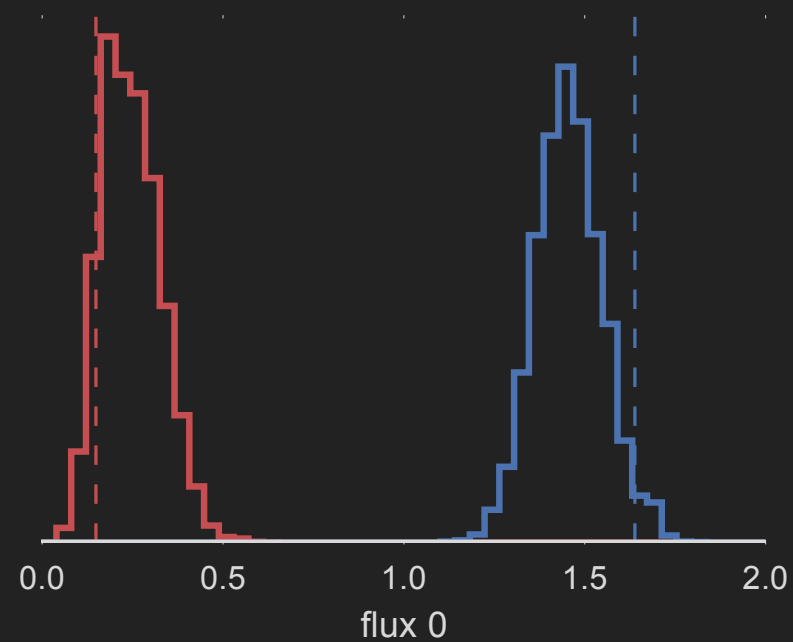
g band



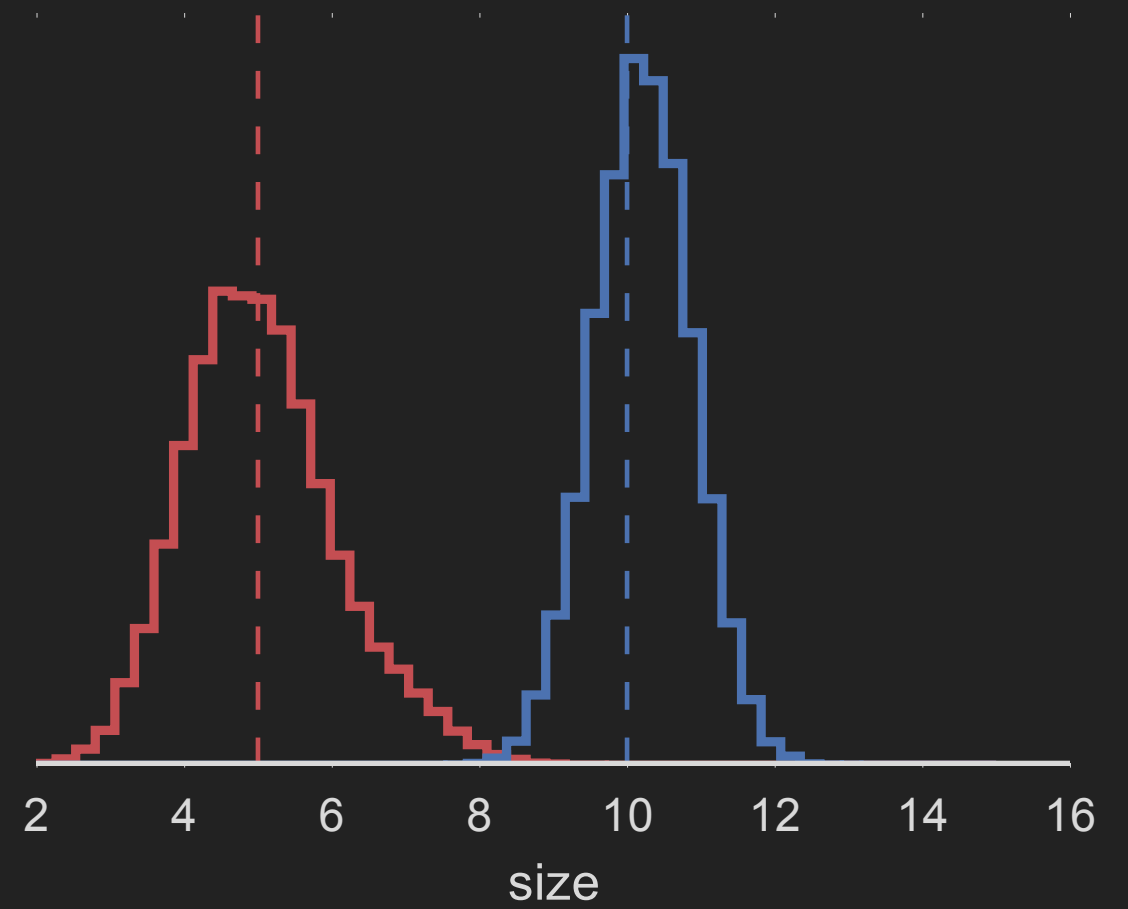
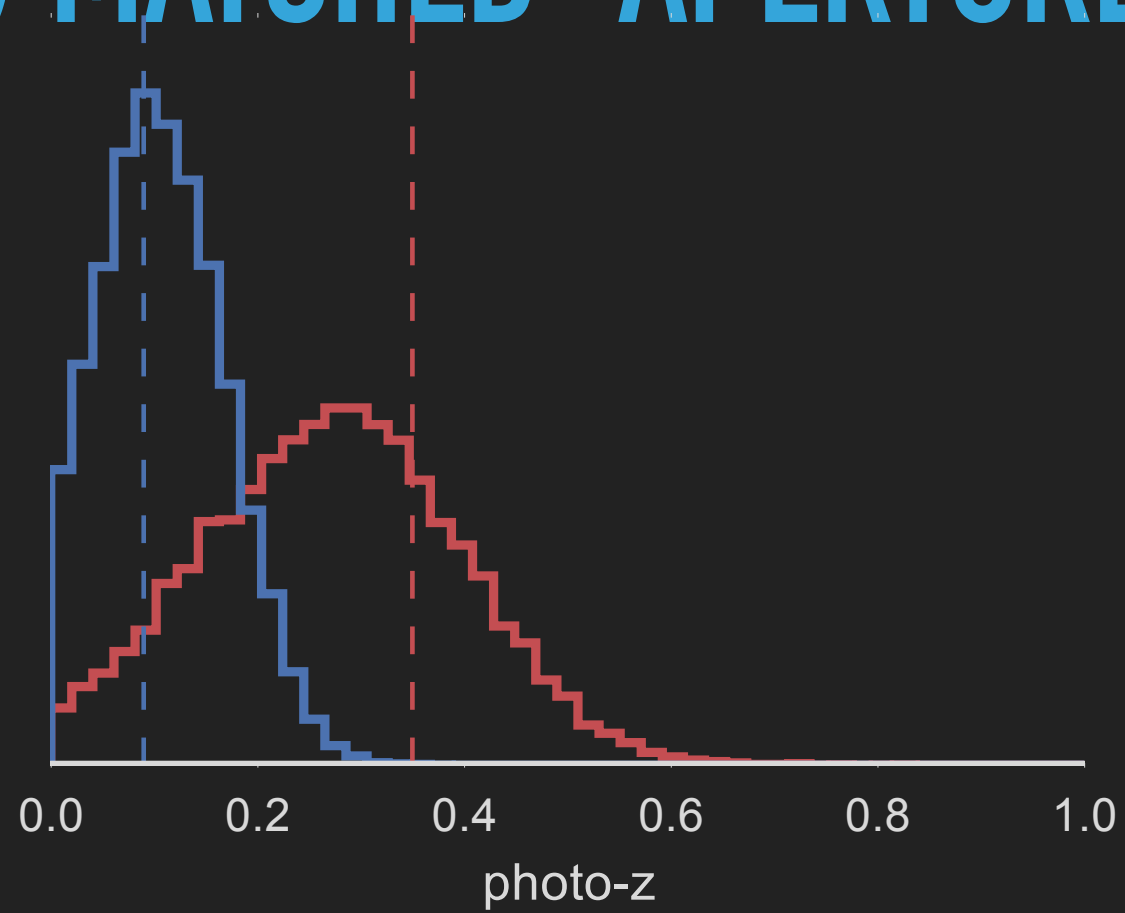
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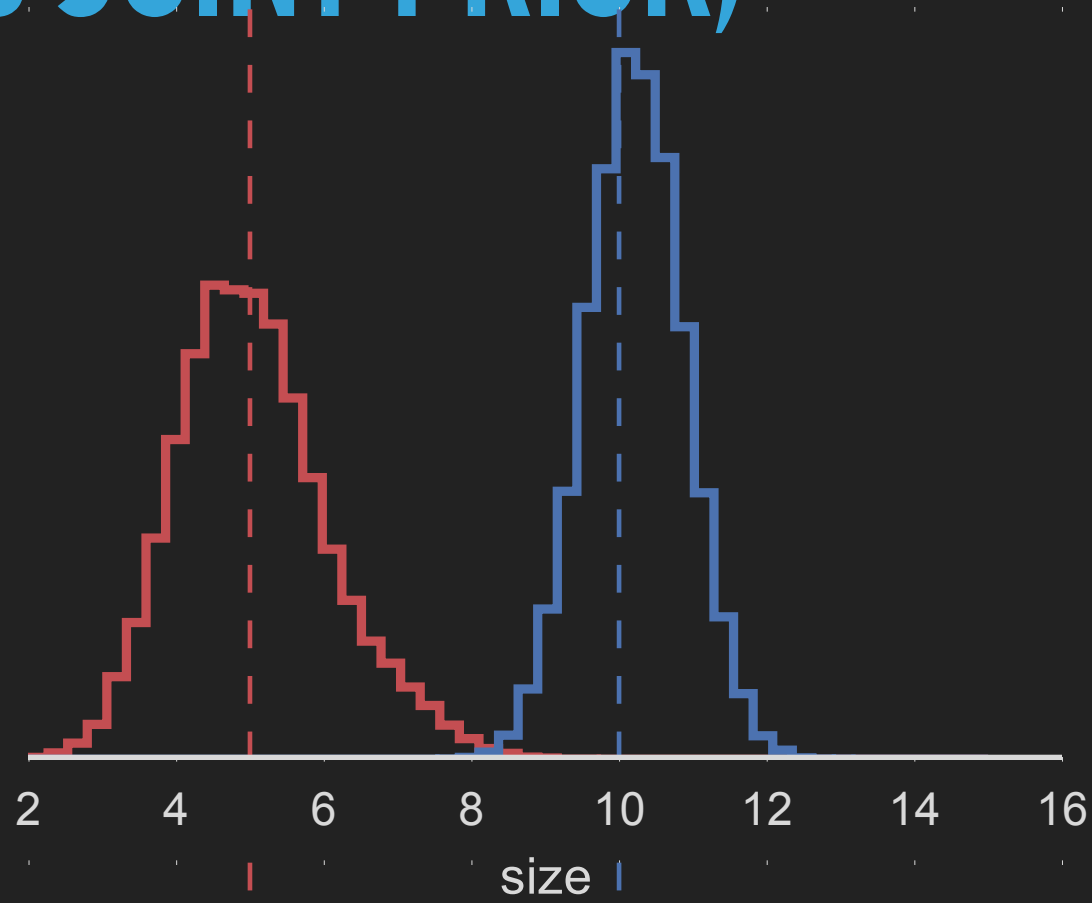
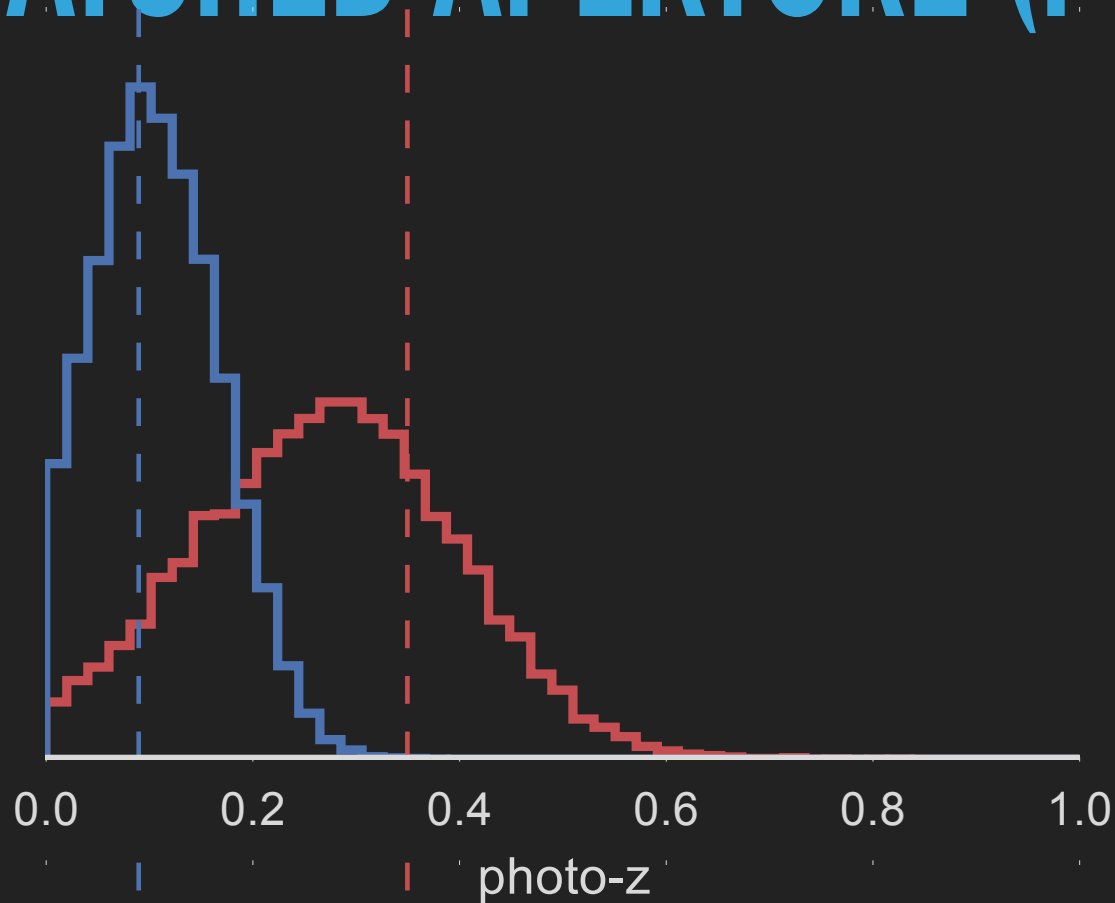
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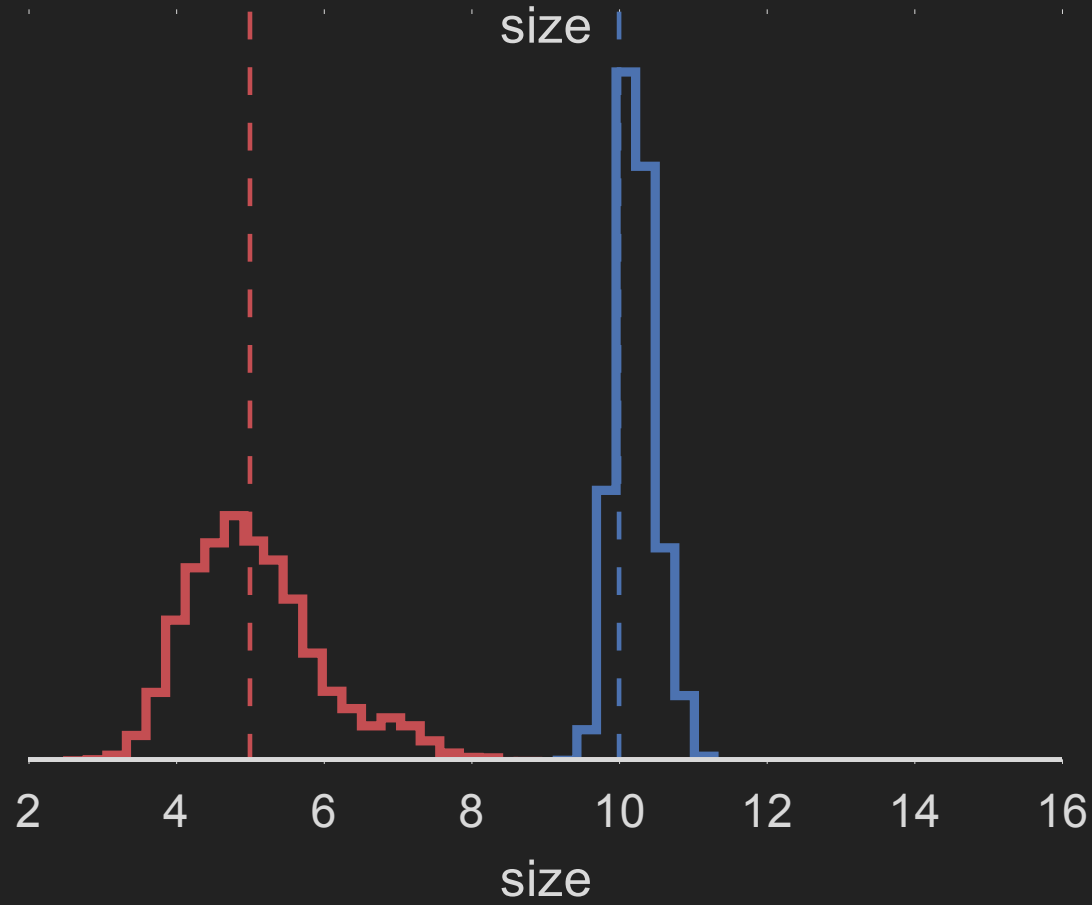
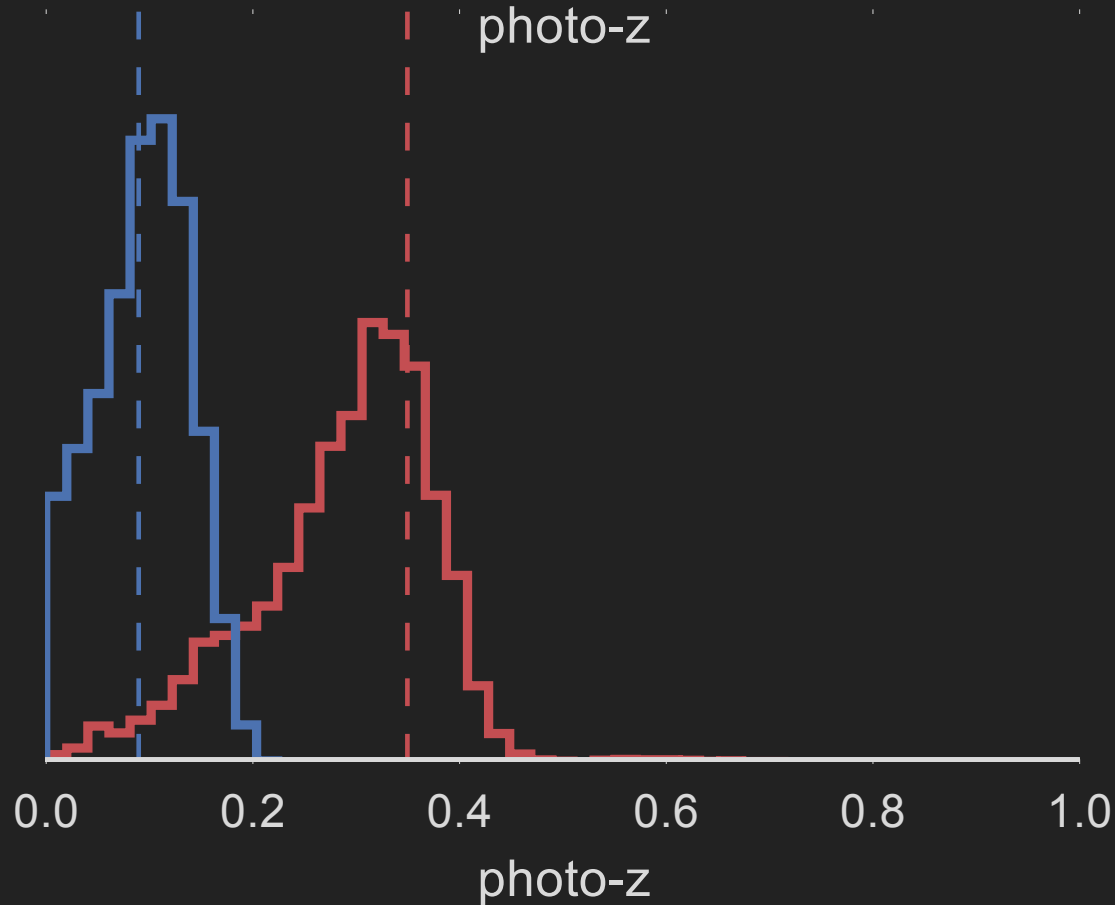


# MATCHED APERTURE (PLUS JOINT PRIOR)

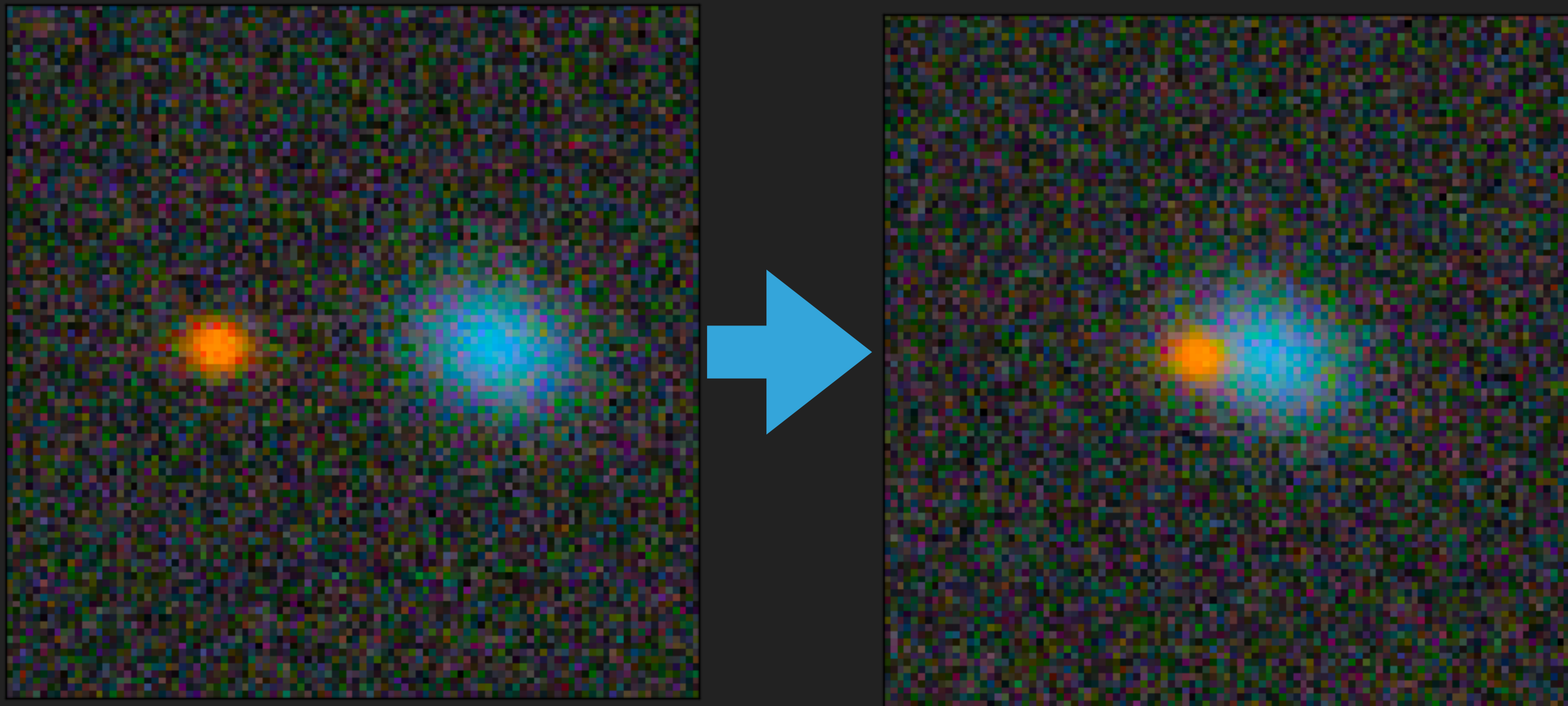
2)



3)



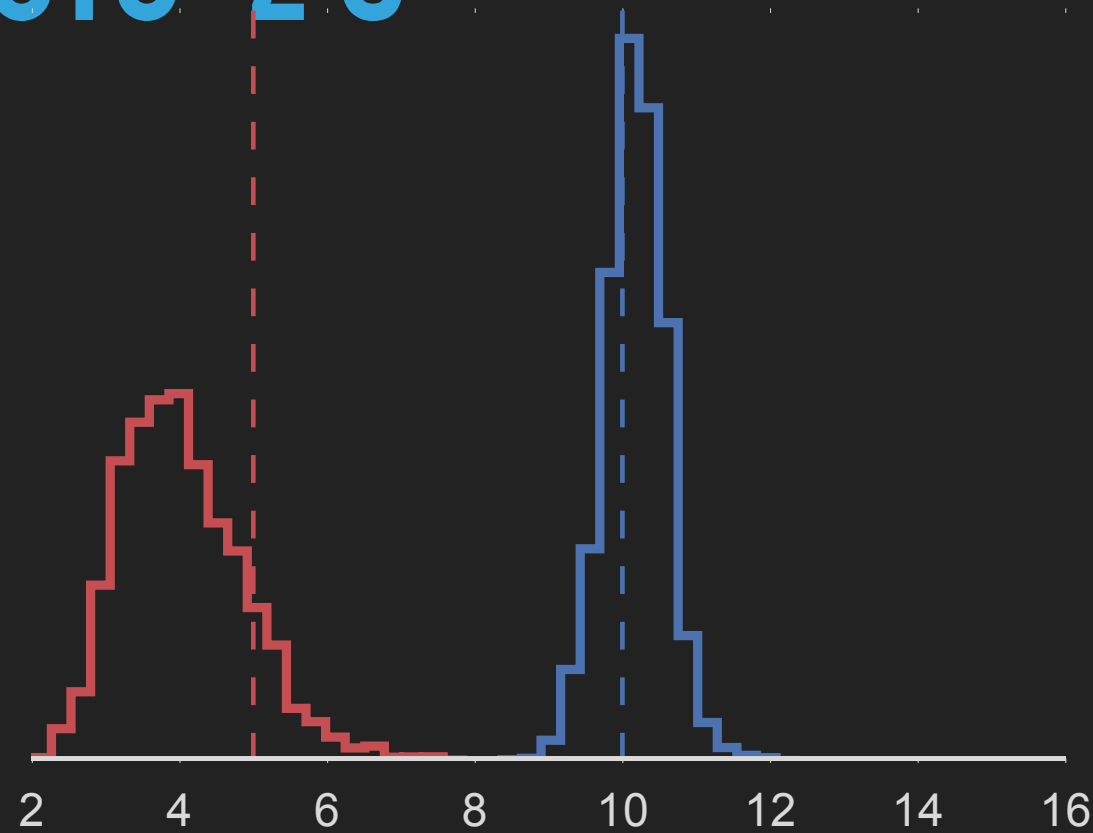
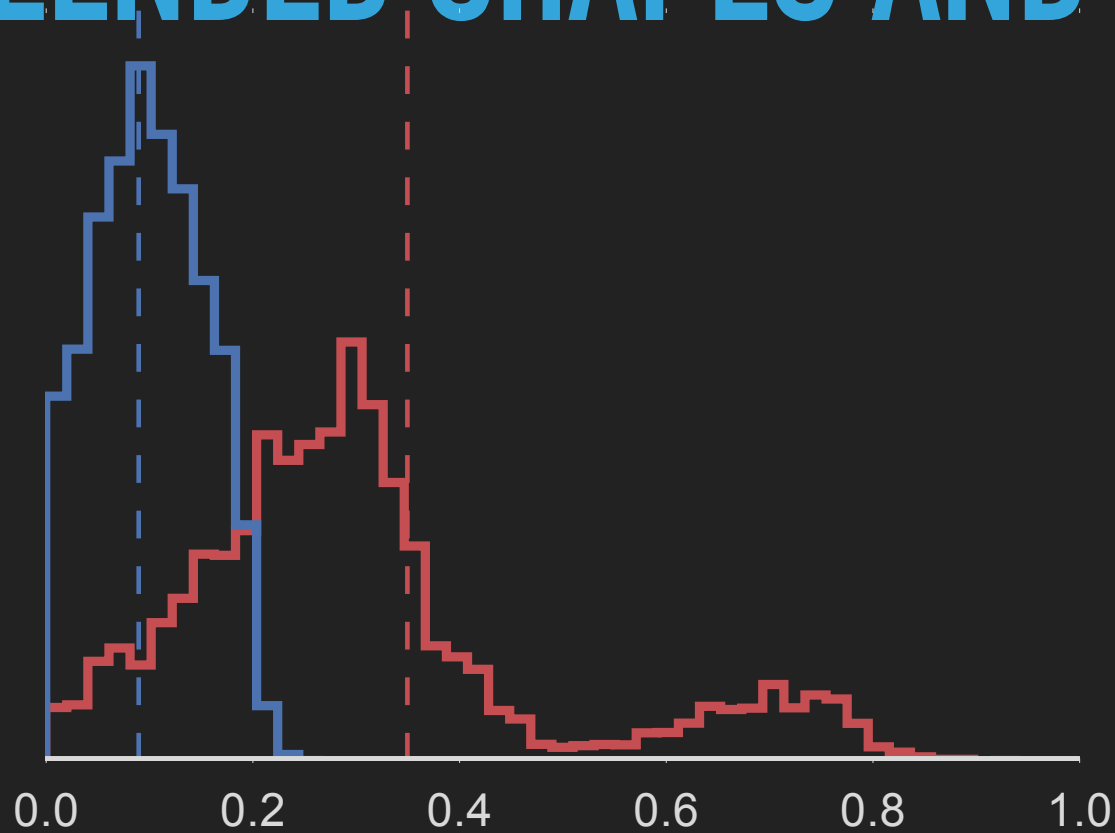
# BLENDING



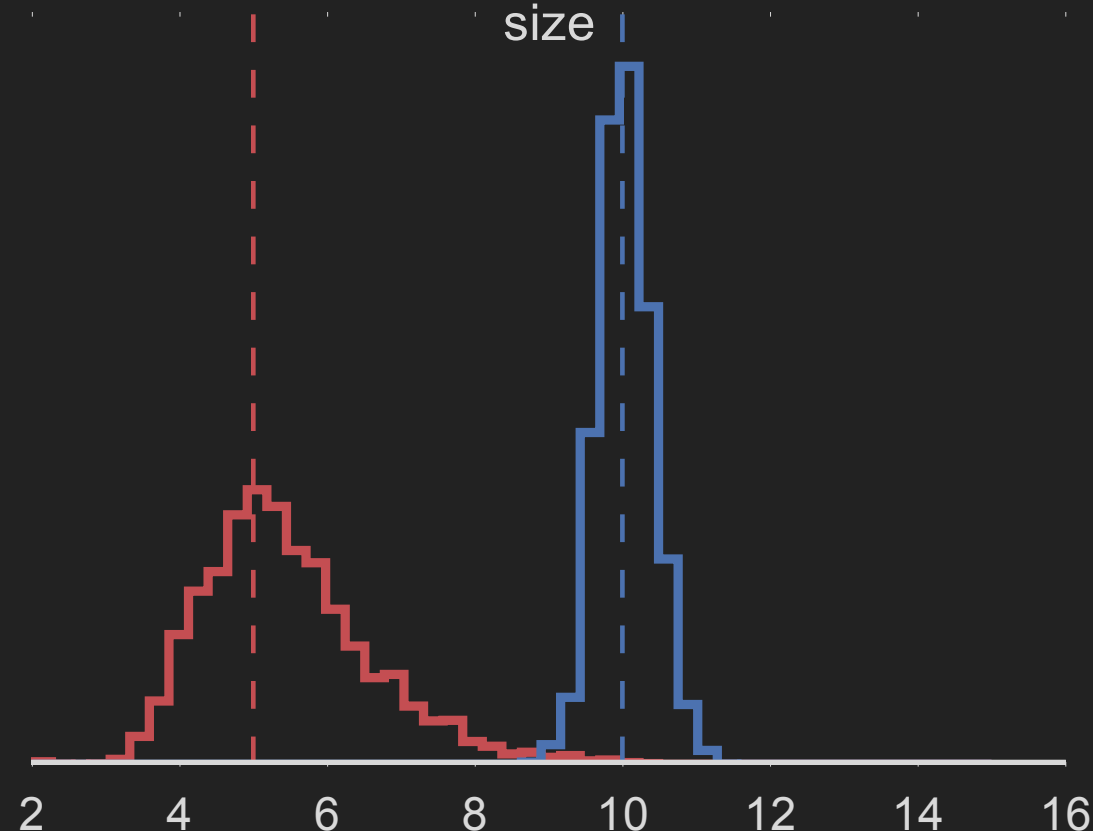
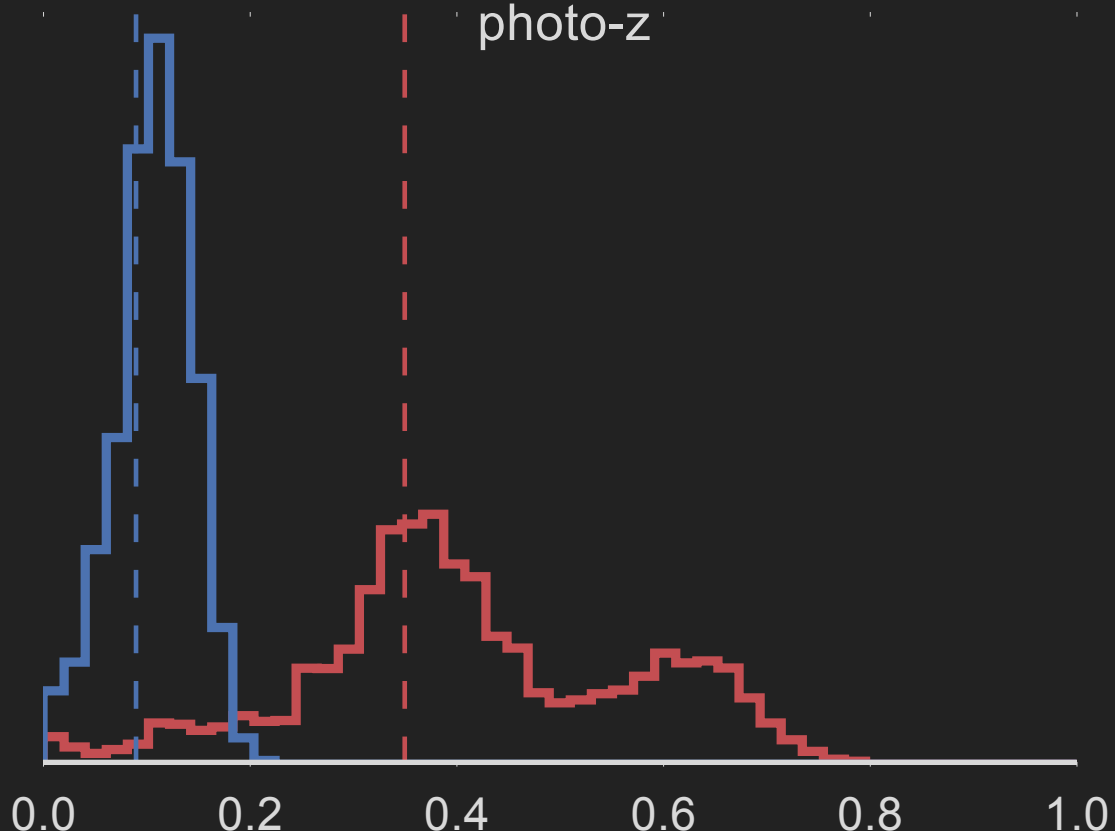


# BLENDED SHAPES AND PHOTO-Z'S

2)



3)



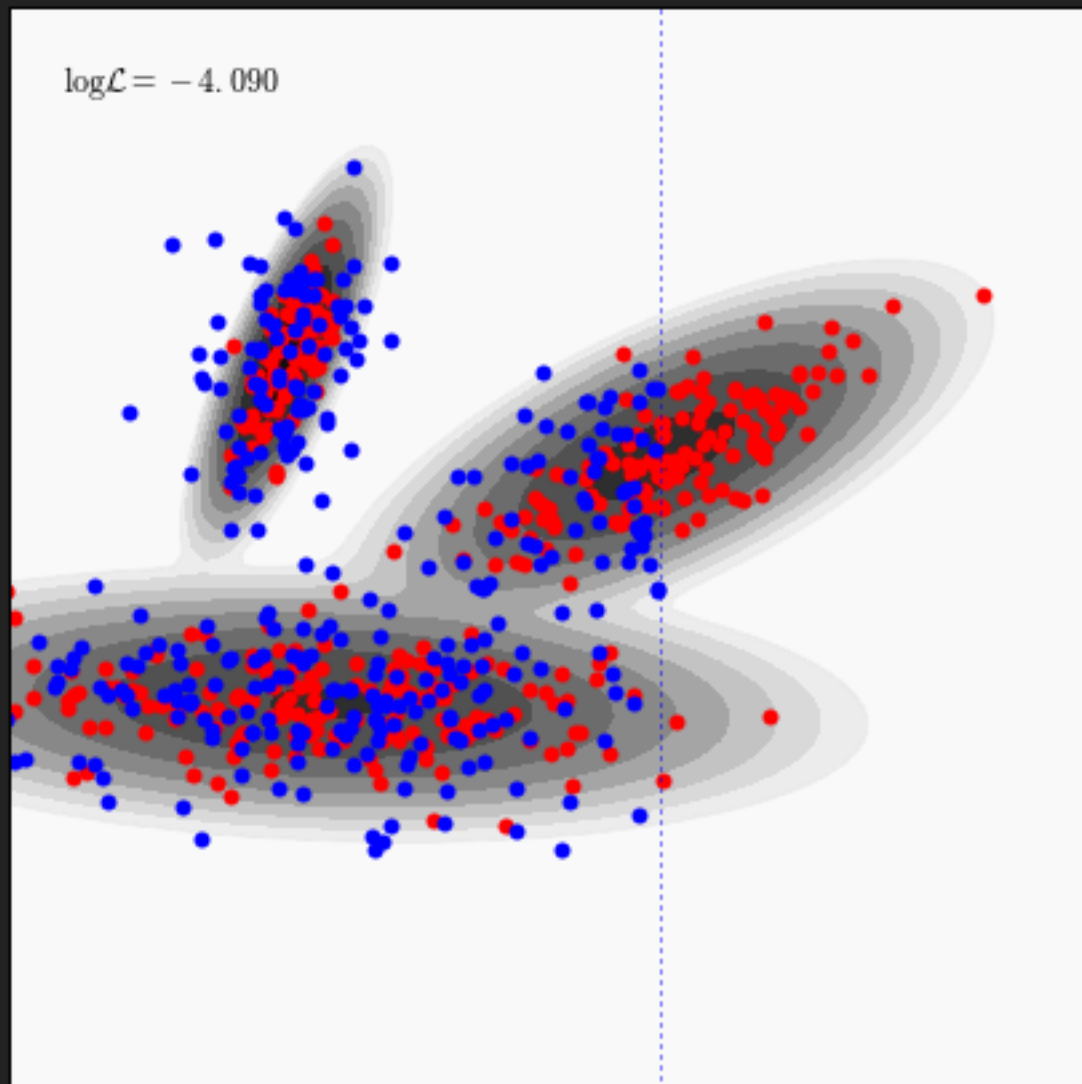
# WHERE DOES THE PRIOR $p(A, \theta)$ COME FROM?

- ▶ LSST deep drilling fields
- ▶ With space-based imaging: precise shapes and blending detection
- ▶ Pixel-level joint analysis of LSST & WFIRST
- ▶ For LSST sans WFIRST: project out WFIRST amplitude space only LSST in likelihood, but LSST & WFIRST-derived priors
- ▶ But: How should we deal with blends? Or noise? Or incompleteness?



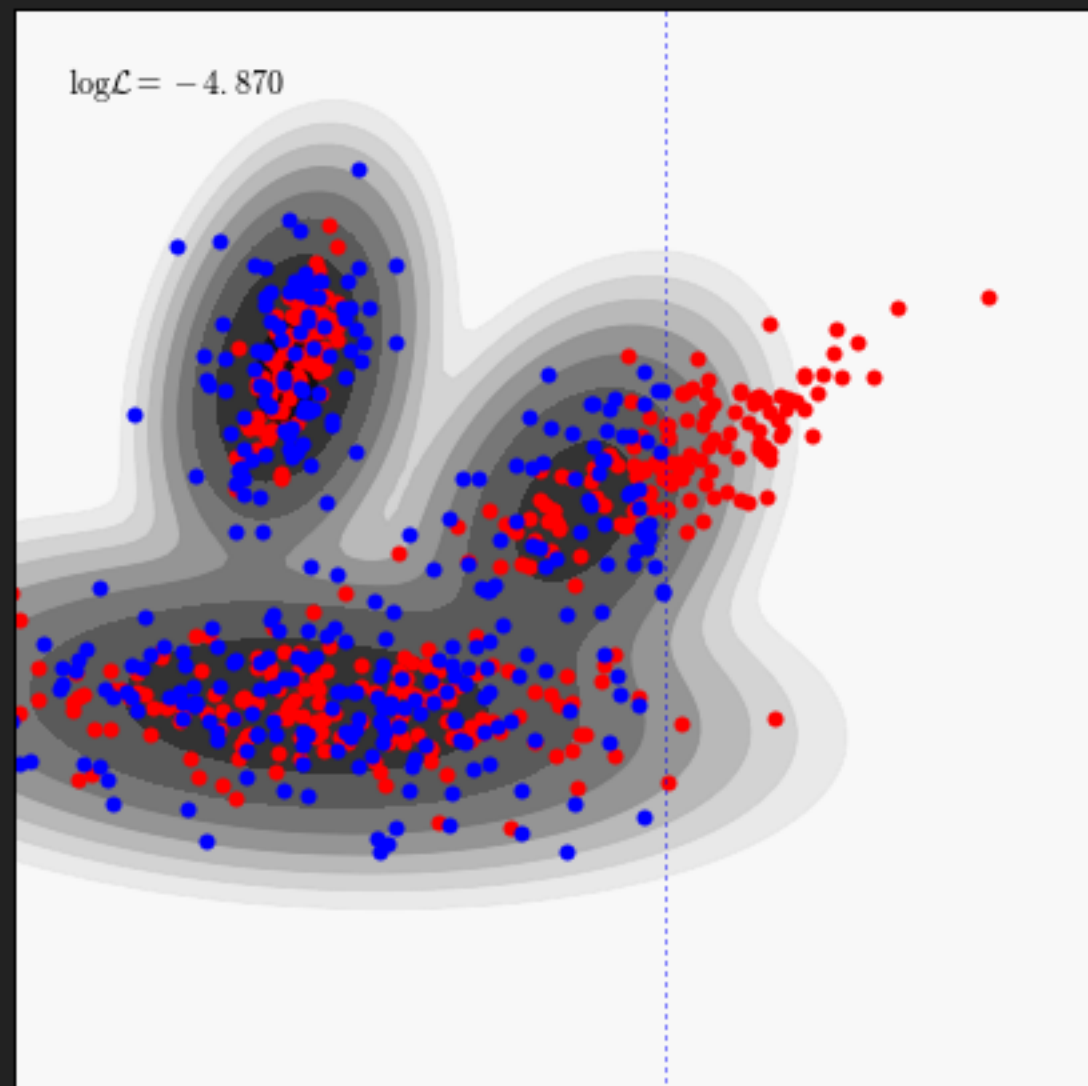
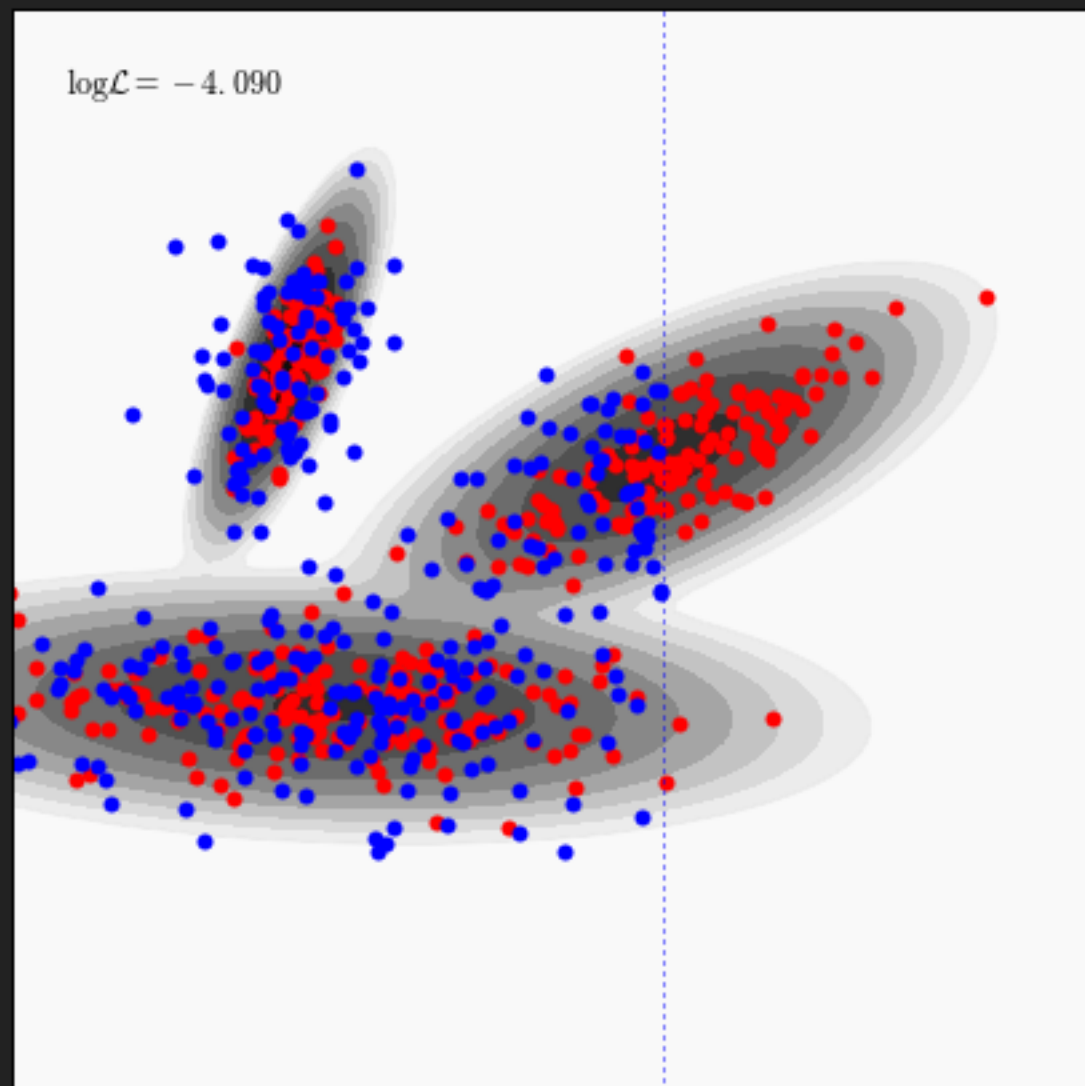
# PRIORS: NOISE AND SELECTIONS

Gaussian-mixture model (Melchior, in prep.)  
to correct for noise and selection effects



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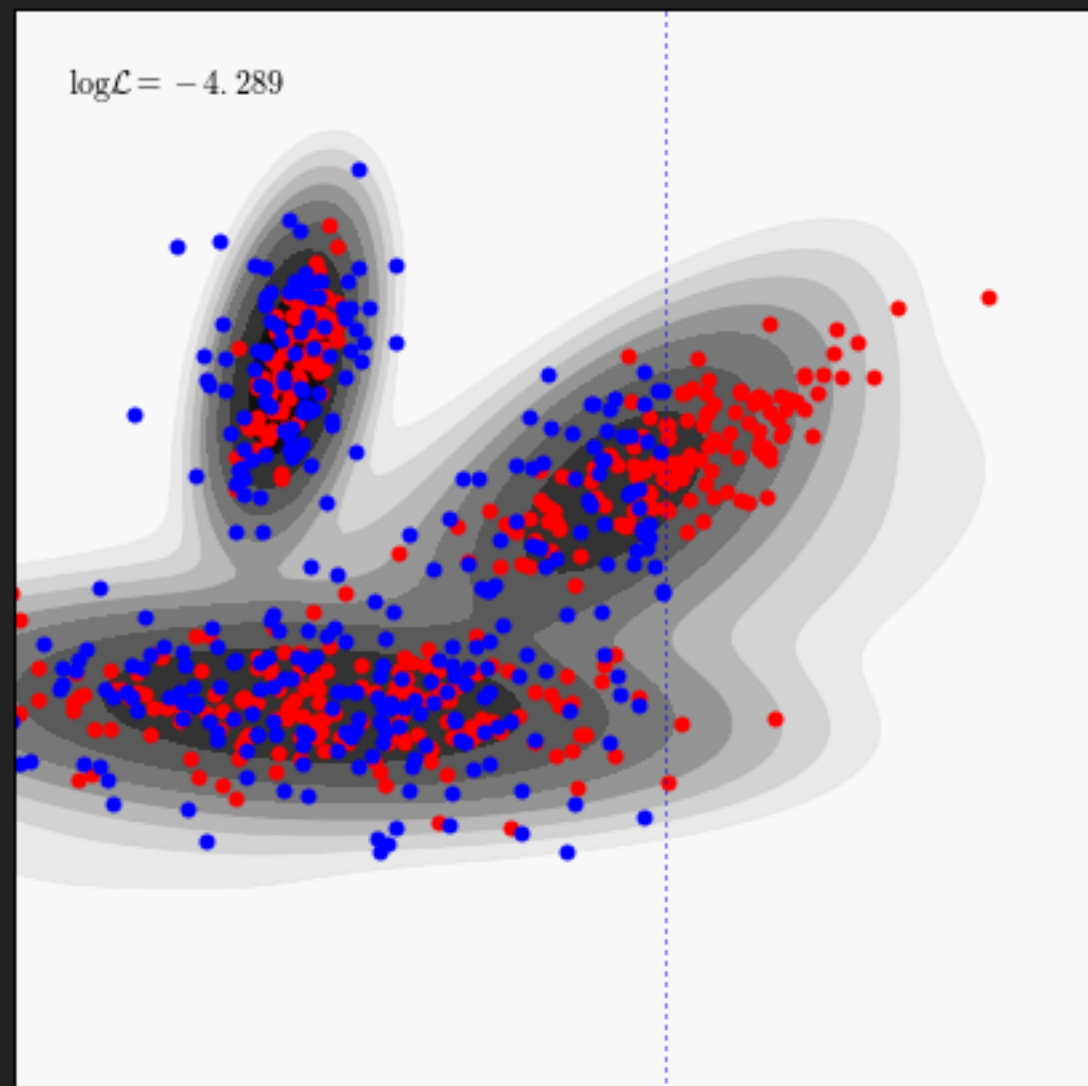
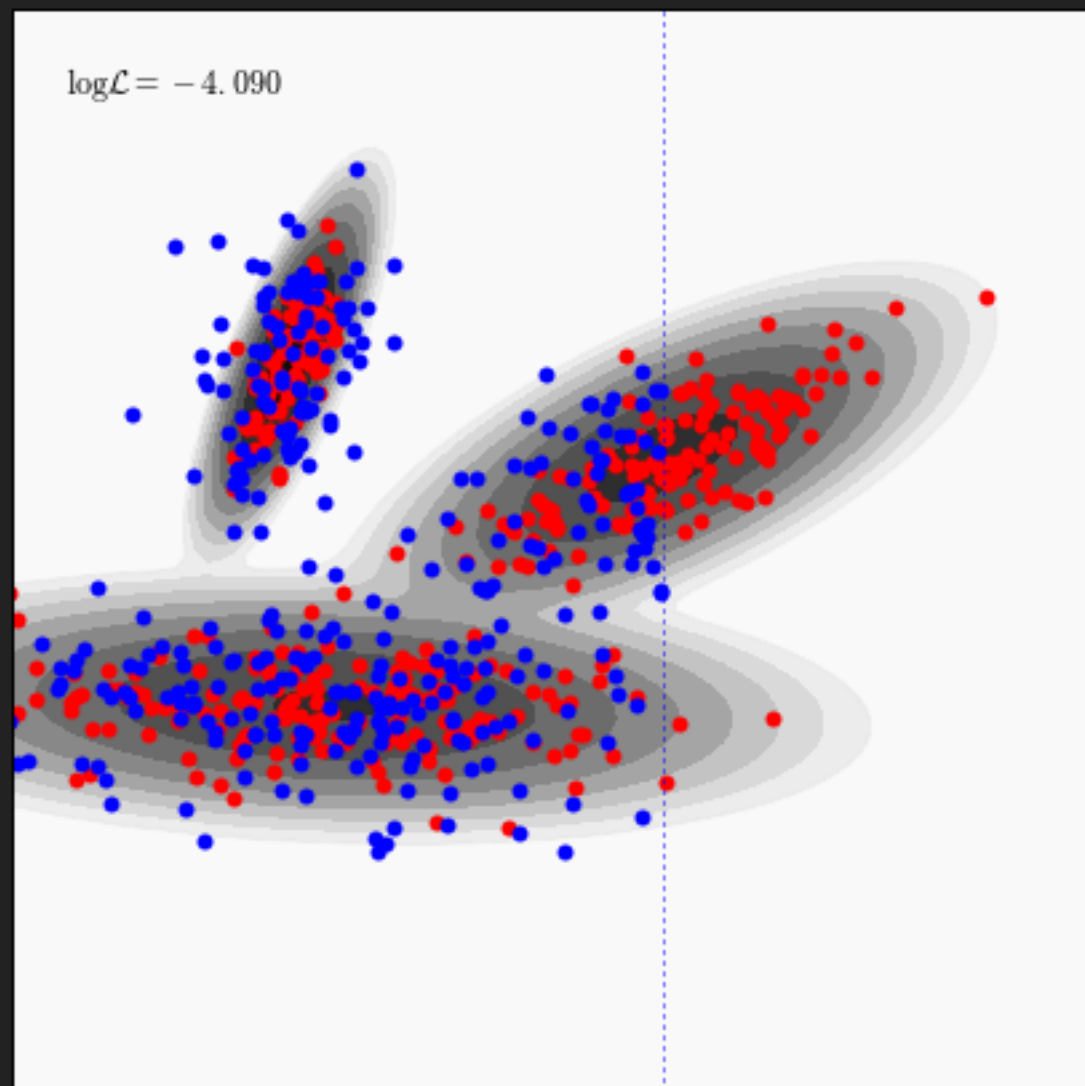
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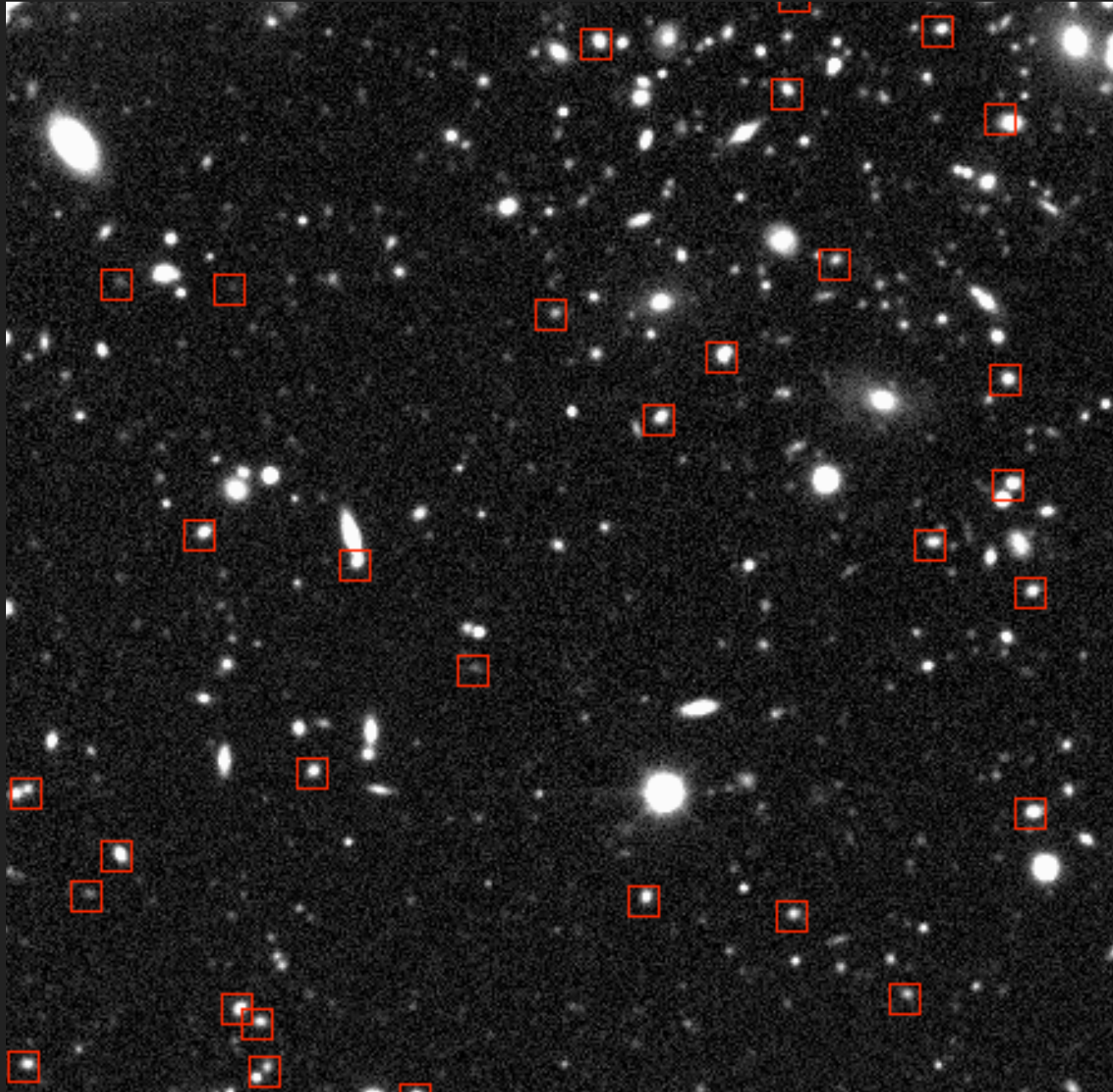
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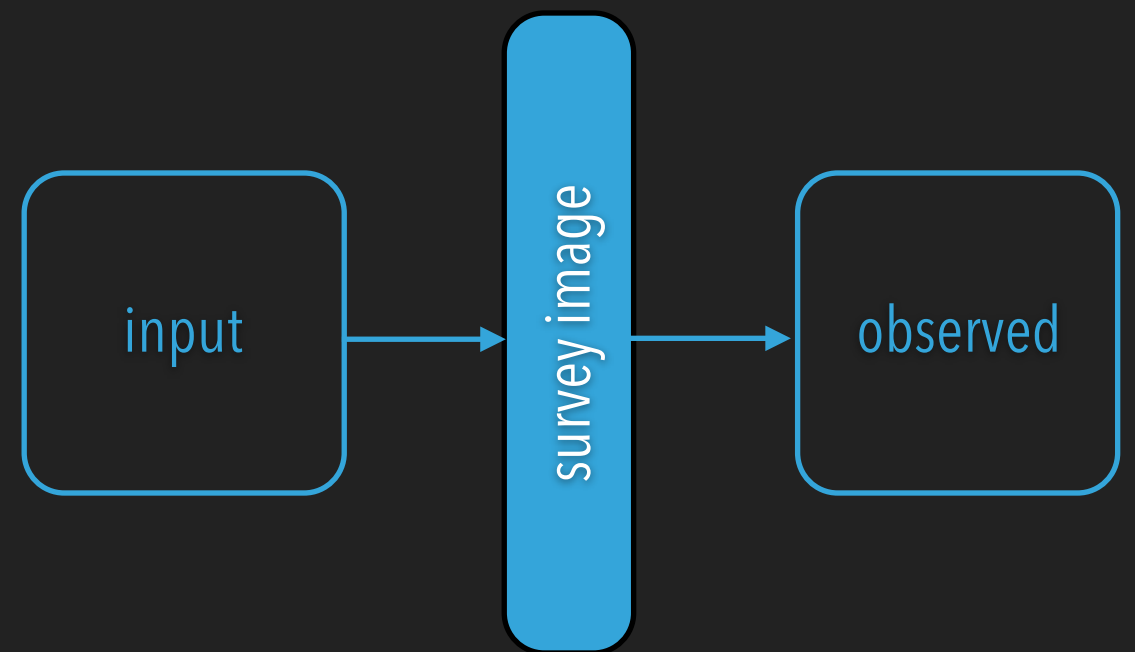


# SELECTIONS: BALROG

SUCHYTA ET AL. (2016)



Inserting mock galaxies and stars into survey images



$$p(O | \theta, z)$$



# JOINT PROCESSING OF LSST & WFIRST

- ▶ Joint detection ("Kaiser coadds")
- ▶ Joint measurement: particularly important to marginally resolved galaxies
- ▶ WFIRST: much better photo-z
- ▶ LSST: much better shapes in HLS overlap area  
Update of galaxy priors for area outside of HLS
- ▶ Minor addition to LSST computing budget
- ▶ LSST DM wants to enable maximum science utilization





ENJOY!